

# Dynamic susceptibility contrast perfusion MRI: concepts and applications

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## Introduction

Since the early studies in the late 1980s, *dynamic susceptibility contrast MRI* (DSC-MRI, also known as '*bolus tracking*') has become a very powerful technique for the assessment of perfusion<sup>1</sup>, and perfusion-related parameters (see (1,2) for recent reviews). Despite the need of an exogenous MR agent (cf. arterial spin labeling techniques), DSC-MRI is currently the *most common MR perfusion methodology in clinical studies*. This is due to the relatively high signal changes introduced by the contrast agent, the short acquisition time required, and the wealth of information that generates (it provides information not only about CBF but also about other hemodynamic parameters within the same scan). It relies on the injection of a *bolus of a paramagnetic contrast agent*, which produces a transient decrease in signal intensity on a series of *gradient-echo or spin-echo images* acquired during its passage through the brain (3). The loss in signal intensity is due to the decrease in  $T_2^*$  or  $T_2$  associated with the susceptibility-induced gradients surrounding the paramagnetic contrast agent (4). This effect is more significant in areas where the contrast agent is compartmentalized (since this increases the induced gradients) and makes quantification of cerebral perfusion in areas with blood-brain barrier (BBB) leakage more complex (see later). Since the passage of the bolus through brain tissue is of the order of a few seconds, a *very fast imaging method is required* to fully characterize the induced signal changes. The most common imaging technique currently used is EPI, which allows for a good compromise between time resolution (typical  $TR \approx 1.5\text{sec}$ ), image coverage (typically 10-15 slices) and spatial resolution (typical voxel size  $2 \times 2 \times 5\text{mm}^3$ ).

## Quantification – Convolution

The changes in relaxation rate  $\Delta R_2^*$  are related to the contrast agent concentration: the larger the concentration, the larger the observed effect. Early work has suggested that this *relationship* can be *assumed to be linear* (3-5):<sup>2</sup>

$$C(t) = k \cdot \Delta R_2^*(t) \quad (1)$$

where  $C(t)$  is the time dependent contrast concentration, and  $k$  is a proportionality constant that depends on the tissue type, the contrast agent, the field strength, and the pulse sequence. Therefore, if *one assumes negligible T1 effects* during the bolus passage,  $C(t)$  can be calculated from the changes in signal intensity with respect to its baseline (i.e. pre-injection) value:

$$C(t) = -\frac{k}{TE} \cdot \ln\left(\frac{S(t)}{S_0}\right) \quad (2)$$

where  $S(t)$  is the signal intensity at time  $t$ ,  $S_0$  is its baseline value, and  $TE$  the echo-time of the MR sequence.

The concentration in the tissue is not only proportional to CBF, but it is also affected by how the study is done (for example, a slower injection will lead to a wider  $C(t)$ ). Using indicator dilution theory, the concentration time course can be shown to be expressed by a *convolution* equation (9,10):

$$C(t) = \alpha \cdot CBF (C_a(t) \otimes R(t)) = \alpha \cdot CBF \int_0^t C_a(\tau) R(t-\tau) d\tau \quad (3)$$

where the symbol  $\otimes$  indicates the convolution operation,  $C_a(t)$  is the *arterial input function* (AIF), i.e. the function describing the contrast agent input to the tissue of interest, and  $R(t-\tau)$  is the tissue *residue function*, which describes

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<sup>1</sup> Throughout this document the terms *perfusion*, *cerebral blood flow* (and its acronym *CBF*) will be used indistinguishable.

<sup>2</sup> Although a linear relationship is usually used, recent studies have suggested that this *linear relationship may not always be valid*, particularly for large contrast concentration such as in big vessels (6,7). Therefore, although the assumption of a linear relationship may be valid for the concentration in the tissue, it may be a significant source of error in the measurement of the arterial input function (see later). Possible solution: use the phase information of the MR images (7,8).

the fraction of contrast agent remaining in the tissue at time  $t$ , following the injection of an ideal instantaneous bolus at time  $\tau$ . The proportionality constant  $\alpha$  depends on the density of brain tissue, and the difference in hematocrit levels between capillaries and large vessels (to compensate for the fact that only the plasma volume is accessible to the contrast agent) (1). The integral in Eq.(3), accounts for the fact that for a non-ideal bolus, part of the spread in the concentration time curve is due to the finite length of the actual bolus. It is possible to interpret the integral expression in Eq.(3) by considering the AIF as a superposition of consecutive ideal boluses “ $C_a(\tau)d\tau$ ” injected at time  $\tau$ . For each ideal bolus, based on the definition of the residue function, the concentration still present in the tissue at time  $t$  will be proportional to “ $C_a(\tau)R(t-\tau)d\tau$ ”, and the total concentration  $C_t(t)$  will be given by the sum (or integral) of all these contributions.

### Quantification – Deconvolution

Quantification of CBF therefore involves inversion of Eq.(3), a mathematical process known as *deconvolution* (10). This *requires measurement of the AIF* (see later), and calculating the scaled residue function  $CBF \cdot R(t)$  (known as the impulse response function). Once this function is calculated, perfusion can be obtained from its initial (or maximum) value, since  $R(t=0)=1$  by definition. Although inverting Eq.(3) (i.e. performing the deconvolution) may appear simple at first sight, this inverse problem is known mathematically as an *ill-posed problem*. This means that even a tiny amount of noise in the measured concentration curves will have huge effect on the calculated impulse response (and thus CBF!). Therefore, a considerable amount of work has been done in the last decade to develop, assess, and compare various deconvolution algorithms. Some of the algorithm proposed to date include: Fourier Transform approach (10,11), singular value decomposition (SVD) and its variants (10,12,13), maximum-likelihood maximization (14), Tikhonov regularization (15), expansion in orthogonal polynomials (16), and Gaussian processes deconvolution (17). Ideally an algorithm should lead to accurate measurements under a wide a range of practical situations, such as under various tissue characteristics (e.g. perfusion values, residue function models), imaging characteristics (e.g. SNR levels), sequence parameters (e.g. TR, TE), as well as for other experimental conditions (such as the presence of bolus delay to areas with abnormal vascular supply). Furthermore, the algorithm should be fast to be able to be used in a clinical environment. Unfortunately, there is currently no single algorithm that fulfils all these requirements; the likely reason for the lack of consensus between users. It is for this reason that this is still an area of very active research.

### Quantification – CBV and MTT

DSC-MRI can provide information not only about perfusion but also about other physiological parameters. For example, due to the compartmentalization of the contrast agent within the intravascular space (for an intact BBB)<sup>3</sup>, the *cerebral blood volume* (CBV) is proportional to the normalized total amount of tracer (i.e. the ‘area under the peak’) (1):

$$CBV = \alpha^{-1} \frac{\int C_t(t)dt}{\int C_a(t)dt} \quad (4)$$

where the proportionality factor  $\alpha^{-1}$  is the inverse of the factor in Eq.(3). The normalization to the integral of AIF accounts for the fact that, the more tracer is injected the greater concentration will reach the tissue, regardless of the CBV. A third physiological parameter accessible by DSC-MRI is the *mean transit time* (MTT: the average time for a molecule of contrast agent to pass through the tissue vasculature following an ideal instantaneous bolus injection). These three physiological parameters are not independent, but they are related through the *central volume theorem* (1):  $MTT=CBV/CBF$ .

### Quantification – Absolute units

DSC-MRI can provide, in principle, CBF in *absolute units* (typically ml/100g/min). There are three main approaches to achieve this:

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<sup>3</sup> When the BBB is not intact, quantification of CBV is more complicated; its calculation must account for the contrast agent in the extravascular space (see later).

1. Use of an internal standard: since CBF measurements using PET have initially suggested a relatively age-independent and uniform white matter value of 22 ml/100g/min in normal adults, a region in normal white matter was proposed as an internal standard to convert the MR measurement to absolute units (18).
2. Knowledge of the proportionality constants: if the values of the constants appearing in the equations above are known, the deconvolution method would lead to absolute measurements (11,19-21).
3. Use of a scaling factor obtained from a cross-calibration study: the MR CBF values can be converted to absolute units by using an empirical conversion factor calculated (usually from a separate study) by cross-calibration of DSC-MRI to a 'gold standard' technique (e.g. PET) (22,23).

Although all these approaches have been used to calculate perfusion in absolute units and the values obtained in normal subjects are consistent with expected CBF values, *there are still some concerns* regarding the accuracy under various physiological conditions (24-27), and the agreement might have been fortuitous. In principle, all the approaches can potentially lead to errors, particularly in the presence of pathology. For example, a recent study has shown a wide variability in white matter CBF values measured with PET on the contralateral hemisphere in patients with chronic carotid occlusion (28). Similarly, some studies have shown that the constant  $k$  in Eq.(1) may vary between tissue types, subjects, as well as between tissue and arteries (6,29). Furthermore, changes in hematocrit levels (and therefore  $\alpha$ ) during pathology have been reported (30,31). Similarly, the validity of a single conversion factor under various physiological conditions remains to be shown (27,28,32). Therefore, absolute CBF measurements in the presence of pathology should be interpreted with caution. Work is currently under way to address many of these issues, and accurate absolute CBF measurements may be possible in the near future.

### Measurement of the AIF

The AIF represents the concentration of tracer entering the tissue at time  $t$ . Although this function can vary throughout the slice, its shape is commonly estimated from a major artery (e.g. the internal carotid artery, or the middle cerebral artery), and used as a global AIF for all the slices. However, the presence of steno-occlusive disease in an artery may cause distortion of the concentration-time curve between the artery and the tissue of interest as a result of the abnormal flow pattern (25). These distortions can introduce considerable errors in the quantification of CBF (33,34), which can have important implications for the diagnosis and management of patients with cerebral ischemia (25,35). Various deconvolution algorithms have been shown to be insensitive to the presence of delay (see for example (11,13,14), and their use is highly advisable. On the other hand, the *errors due to bolus dispersion* are not related to the particular deconvolution algorithm used, but they are a more fundamental limitation of the model used in Eq.(3); this equation assumes that the *true* AIF is measured, and the unaccounted dispersion will be then assigned to occurring within the tissue of interest (i.e. interpreted as a prolonged MTT and decreased CBF (35)). Therefore, it should be noted that while the particular choice of deconvolution algorithm can remove the delay-related errors, it cannot eliminate those associated to bolus dispersion.

To minimize the errors related to bolus dispersion, it has been proposed that a local AIF should be used instead (37-38). This requires the estimation of the AIF from an artery as close as possible to the tissue of interest. In fact, by definition, the AIF should be measured on a pixel-by-pixel basis, and a local AIF should be used for the deconvolution in each voxel. This approach is likely to be particularly sensitive to partial volume effects, and various methods to define a local AIF have been proposed. Although further work is required to validate these approaches, they may prove to be a promising solution to minimizing the dispersion-related errors in certain group of patients, such as those with arterial stenosis or occlusion.

### Quantification – BBB breakdown

The kinetic model described in Eq.(3) is based on the assumption that the contrast agent remains intravascular. If this not the case (e.g. when the BBB is disrupted), the distribution of the contrast agent outside the vascular compartment decreases the  $T2^*$  effects, as well as increases the  $T1$  effects (usually neglected) during the passage of the bolus. If these effects are not minimized (39) or taken into account (40), significant errors can be introduced in quantification of DSC-MRI data (see (41) for a recent review). In order to account for the  $T_1$  effects, Weisskoff et al (42) modeled the MR signal in terms of the combined  $T1$  and  $T2^*$  contributions. In such a way, they proposed a method to quantify CBV in the presence of contrast leakage, as well as an estimation of vascular permeability (42,43). More recently, this work has been extended to quantify not only CBV and a measure of permeability, but

also CBF (40,44). Since the effects of contrast leakage are included, it should provide a more accurate estimation of perfusion when the BBB is disrupted, although a full validation of these modified models remains to be done.

### **Applications – Acute stroke**

The main application by far has been in *cerebral ischemia*, particularly in the context of acute *stroke* (see (39,45) for recent reviews). The concept of ‘*diffusion-perfusion mismatch*’ (area with an abnormality observed on DSC-MRI but with normal appearing MR diffusion properties) has received great interest in the last decade. Several studies reported the expansion of the initial lesion seen on diffusion imaging, such that the final infarct included tissue that was in the diffusion-perfusion mismatch area during the hyperacute stage. It was initially believed that the mismatch area could therefore be used to identify the ischemic *penumbra* (tissue with preserved neuronal integrity but hypoperfused at a level to cause functional impairment). However, many studies have now shown that not all the mismatch area corresponds to penumbra (46): some of the mismatch can represent tissue areas with *benign oligemia* (areas with normal or slightly decreased perfusion that will survive independently of treatment effects) (47).<sup>4</sup> To improve the tissue characterization during the hyperacute stage, it is now becoming apparent that none of the DSC-MRI maps in isolation will be robust enough to identify the tissue at risk of infarction with sufficient sensitivity and specificity. In the last few years, many groups have been developing *predictor models of tissue infarction* by combining all the available information: the maps obtained using DSC-MRI are used, in combination with diffusion- and T<sub>2</sub>-weighted images, in models to predict the fate of the tissue in acute stroke (e.g. see (48-51)), with the final aim of identifying the patients that are more likely to benefit from therapy. This is an area of very active research at present, and a comparison of the various models on a common dataset could prove very useful.

### **Applications – Chronic ischemia**

The areas of mismatch have been observed not only during acute stroke, but also in patients with chronic hypoperfusion. These included patients with internal carotid stenosis or occlusion (16,27,28,52,53), as well as children with high stroke incidence such as those with sickle cell disease (54) and moyamoya syndrome (55). Extensive areas of decreased perfusion (in many cases with normal structural and diffusion imaging (54,55) have been reported. These studies suggest that areas of decreased perfusion can persist for long periods of time, although it is not clear how long such compromised tissue could survive, since the flow “thresholds” for energy failure are expected to increase with time. However, it should be noted that due to the vascular abnormalities present in many of these patients, a significant part of the mismatch area could be associated to errors due to bolus delay and dispersion (25,46).

### **Applications – Treatment assessment**

The use of DSC-MRI has a potential role not only in the identification of tissue at risk of infarction, but also in monitoring the efficacy of interventional strategies. For example, to determine the presence and extent of recanalization (either spontaneous or due to thrombolysis) (56,57), to evaluate the effect of blood transfusion therapy on brain perfusion in patients with sickle cell disease (54), and to assess the effectiveness of surgical revascularisation in moyamoya syndrome (55).

### **Applications – Cerebrovascular reserve capacity**

Perfusion MRI can provide information not only about the “resting” tissue perfusion status, but also about the cerebrovascular reserve capacity. It has been suggested that measurements of regional cerebrovascular reactivity in response to carbon-dioxide, breath holding or acetazolamide could potentially identify the subgroup of patients with carotid artery stenosis or occlusion who may be at increased risk of stroke (58). Perfusion MRI provides a non-invasive means to obtain such information, with good spatial resolution, by comparing the measurement before to that after the vasodilatory stimulus (see for example, (16,32,52)).<sup>5</sup>

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<sup>4</sup> In many cases, the misclassification of oligemia as penumbra can be due to the errors introduced by delay and dispersion: these distortions in the bolus have been shown to introduce CBF and MTT errors (33), which could be misinterpreted as severe hypoperfusion, with potentially serious clinical consequences for patient management (25).

<sup>5</sup> It should be noted that studies of cerebrovascular reserve require repeated injections of contrast agent in DSC-MRI. To avoid the residual effects of the first bolus during the second study, it is advisable to inject a small pre-dose of contrast agent a few minutes before the first study (39).

## Applications – Tumors

Due to the complexities of quantifying CBF in the presence of BBB leakage, the majority of the DSC-MRI studies so far have focused on measuring CBV and a permeability index. These applications included use of DSC-MRI for tumor grading, for determining its extent, for the differential diagnosis of recurrence vs. radiation necrosis, and for guiding tumor biopsy (see (59-61) for recent reviews). However, there have been some studies which used the modified (to include leakage) indicator dilution theory (40,44), and quantified also CBF by deconvolution.

## Conclusion

DSC-MRI is a very powerful technique that provides unique information regarding cerebral hemodynamics. It has been extensively used for the assessment and management of patients, as well as being an invaluable tool in experimental studies. The principles of measuring perfusion using DSC-MRI have been reviewed, and the main assumptions and steps required for CBF quantification described. The main limitations and artifacts that can affect the accuracy of CBF quantification have been discussed, and the main areas of application were reviewed.

## References

1. Calamante F, Thomas DL, Pell GS, Wiersma J, Turner (1999). Measuring cerebral blood flow using magnetic resonance techniques. *J Cereb Blood Flow Metab* 19:701-735.
2. Barbier EL, Lamalle L, Décorps M (2001). Methodology of brain perfusion imaging. *J Magn Reson Imaging* 13:496-520.
3. Rosen BR, Belliveau JW, Vevea JM, Brady TJ (1990). Perfusion imaging with NMR contrast agents. *Magn Reson Med* 14:249-265.
4. Villringer A, Rosen BR, Belliveau JW, Ackerman JL, Lauffer RB, Buxton RB, Chao YS, Wedeen VJ, Brady TJ (1988) Dynamic imaging with lanthanide chelates in normal brain: contrast due to magnetic-susceptibility effects. *Magn Reson Med* 6:164-174.
5. Weisskoff RM, Zuo CS, Boxerman JL, Rosen BR (1994b) Microscopic susceptibility variation and transverse relaxation. Theory and experiment. *Magn Reson Med* 31:601-610.
6. Kiselev VG (2001) On the theoretical basis of perfusion measurements by dynamic susceptibility contrast MRI. *Magn Reson Med* 46:1113-1122.
7. van Osch MJP, Vonken EPA, Viergever MA, van der Grond J, Bakker CJG (2003). Measuring the arterial input function with gradient echo sequences. *Magn Reson Med* 49:1067-1076.
8. Akbudak E, Conturo TE (1996). Arterial input functions from MR phase imaging. *Magn Reson Med* 36:809-815.
9. Zierler KL (1962). Theoretical basis of indicator-dilution methods for measuring flow and volume. *Circ Res* 10:393-407.
10. Østergaard L, Weisskoff RM, Chesler DA, Gyldensted C, Rosen BR (1996) High resolution measurement of cerebral blood flow using intravascular tracer bolus passages. Part I. Mathematical approach and statistical analysis. *Magn Reson Med* 36:715-725.
11. Rempp KA, Brix G, Wenz F, Becker CR, Guckel F, Lorenz WJ (1994). Quantification of regional cerebral blood flow and volume with dynamic susceptibility contrast-enhanced MR imaging. *Radiology* 193:637-641.
12. Liu HL, Pu Y, Liu Y, Nickerson L, Andrews T, Fox PT, Gao JH (1999). Cerebral blood flow measurement by dynamic contrast MRI using singular value decomposition with an adaptive threshold. *Magn Reson Med* 42:167-172.
13. Wu O, Østergaard L, Weisskoff RM, Benner T, Rosen BR, Sorensen AG (2003). Tracer arrival timing-insensitive technique for estimating flow in MR perfusion-weighted imaging using singular value decomposition with a block-circulant deconvolution matrix. *Magn Reson Med* 50:164-174.
14. Vonken EP, Beekman FJ, Bakker CJ, Viergever MA (1999). Maximum likelihood estimation of cerebral blood flow in dynamic susceptibility contrast MRI. *Magn Reson Med* 41:343-350.
15. Calamante F, Gadian DG, Connelly A (2003). Quantification of bolus tracking MRI: improved characterization of the tissue residue function using Tikhonov regularization. *Magn Reson Med* 50:1237-1247.
16. Schreiber WG, Guckel F, Stritzke P, Schmiedek P, Schwartz A, Brix G (1998). Cerebral blood flow and cerebrovascular reserve capacity: estimation by dynamic magnetic resonance imaging. *J Cereb Blood Flow Metab* 18:1143-1156.

17. Andersen IK, Szymkowiak A, Rasmussen CE, Hanson L, Marstrand JR, Larsson HBW, Hansen LK (2002). Perfusion quantification using Gaussian process deconvolution. *Magn Reson Med* 48:351–361.
18. Østergaard L, Sorensen AG, Kwong KK, Weisskoff RM, Gyldensted C, Rosen BR (1996) High resolution measurement of cerebral blood flow using intravascular tracer bolus passages. PartII. Experimental comparison and preliminary results. *Magn Reson Med* 36:726-736.
19. Vonken EPA, van Osch MJP, Baker CJG, Viergever MA (1999). Measurement of cerebral perfusion with dual-echo multi-slice quantitative dynamic susceptibility contrast MRI. *J Magn Reson Imaging* 10:109-117.
20. Smith AM, Grandin CB, Duprez T, Mataigne F, Cosnar G (2000). Whole brain quantitative CBF and CBV measurements using MRI bolus tracking: comparison of methodologies. *Magn Reson Med* 43:559-654.
21. Grandin CB, Duprez TP, Smith AM, Mataigne F, Peeters A, Oppenheim C, Cosnard G (2001). Usefulness of magnetic resonance-derived quantitative measurements of cerebral blood flow and volume in prediction of infarct growth in hyperacute stroke. *Stroke* 32:1147-1153.
22. Østergaard L, Johannsen P, Poulsen PH, Vestergaard-Poulsen P, Asboe H, Gee AD, Hansen SB, Cold GE, Gjedde A, Gyldensted C (1998). Cerebral blood flow measurements by magnetic resonance imaging bolus tracking: comparison with [O-15] H<sub>2</sub>O positron emission tomography in humans. *J Cereb Blood Flow Metab* 18:935-940.
23. Østergaard L, Smith DF, Vestergaard-Poulsen P, Hansen SB, Gee AD, Gjedde A, Gyldensted C (1998). Absolute cerebral blood flow and blood volume measured by magnetic resonance imaging bolus tracking: comparison with positron emission tomography values. *J Cereb Blood Flow Metab* 18:425-432.
24. Sorensen AG (2001) What is the meaning of quantitative CBF? *AJNR Am J Neuroradiol* 22:235-236.
25. Calamante F, Gadian DG, Connelly A (2002). Quantification of perfusion using bolus tracking MRI in stroke. Assumptions, limitations, and potential implications for clinical use. *Stroke* 33:1146-1151.
26. Calamante F (2005). Artifacts and pitfalls in perfusion MR imaging. Book: *Clinical MR Neuroimaging: diffusion, perfusion and spectroscopy* (Editors: J. Gillard, A. Waldman and P. Barker). Cambridge University Press; pp. 141-160.
27. Lin W, Celik A, Derdeyn C, An H, Lee Y, Videen T, Østergaard L, Powers WJ (2001) Quantitative measurements of cerebral blood flow in patients with unilateral carotid artery occlusion: a PET and MR study. *J Magn Reson Imaging* 14:659-667.
28. Mukherjee P, Kang HC, Videen TO, McKinstry RC, Powers WJ, Derdeyn CP (2003). Measurement of cerebral blood flow in chronic carotid occlusive disease: comparison of dynamic susceptibility contrast perfusion MR imaging with positron emission tomography. *AJNR Am J Neuroradiol* 24:862-871.
29. Johnson KM, Tao JZT, Kennan RP, Gore JC (2000) Intravascular susceptibility agent effects on tissue transverse relaxation rates in vivo. *Magn Reson Med* 44:909-914.
30. Loufti I, Frackowiak RS, Myers MJ, Lavender JP (1987). Regional brain hematocrit in stroke by single photon emission computer tomography imaging. *Am J Physiol Imaging* 2:10-16.
31. Yamamuchi H, Fukuyama H, Nagahama Y, Katsumi Y, Okazawa H (1998). Cerebral hematocrit decreases with hemodynamic compromise in carotid artery occlusion: a PET study. *Stroke* 29:98-103.
32. Grandin C, Bol A, Smith A, Michel C, Cosnard G (2005). Absolute CBF and CBV measurements by MRI bolus tracking before and after acetazolamide challenge: repeatability and comparison with PET in humans. *Neuroimage* 26: 525-535.
33. Calamante F, Gadian DG, Connelly A (2000). Delay and dispersion effects in dynamic susceptibility contrast MRI: simulations using singular value decomposition. *Magn Reson Med* 44:466-473.
34. Østergaard L, Chesler DA, Weisskoff RM, Sorensen AG, Rosen BR (1999) Modeling cerebral blood flow and flow heterogeneity from magnetic resonance residue data. *J Cereb Blood Flow Metab* 19:690-699.
35. Calamante F (2005). Bolus dispersion issues related to the quantification of perfusion MRI data. *J Magn Reson Imaging* 22:718-722.
36. Wirestam R, Ryding E, Lindgren A, Geijer B, Holtas S, Stahlberg F (2000) Absolute cerebral blood flow measured by dynamic susceptibility contrast MRI: a direct comparison with Xe-133 SPECT. *MAGMA* 11:96-103.
37. Alsop D, et al. (2002). Defining a local input function for perfusion quantification with bolus contrast MRI. In: *Proc ISMRM, Honolulu*, p.659.
38. Calamante F, Mørup M, Hansen LK (2004). Defining a local arterial input function for perfusion MRI using independent component analysis. *Magn Reson Med* 52:789-797.
39. Sorensen AG, Reimer P (2000) Cerebral MR perfusion imaging. Principles and current applications. Georg Thieme Verlag , Stuttgart, Germany.

40. Vonken EPA, van Osch MJP, Baker CJG, Viergever MA (2000) Simultaneous qualitative cerebral perfusion and Gd-DTPA extravasation measurements with dual-echo dynamic susceptibility contrast MRI. *Magn Reson Med* 43:820-827.
41. Calamante F (2005). Quantification of dynamic susceptibility contrast T2\* MRI in oncology. In series: Medical Radiology – Diagnostic Imaging. Book: Dynamic Contrast-Enhanced Magnetic Resonance Imaging in Oncology (Editors: A. Jackson, D.L. Buckley and G.J.M. Parker). Springer-Verlag, Heidelberg; pp. 53-67.
42. Weisskoff RM, Boxerman JL, Sorensen AG, Kulke SM, Campbell TA, Rosen BR (1994) Simultaneous blood volume and permeability mapping using a single Gd-based contrast injection. In: Proceedings of the 2nd Annual Meeting of SMRM, San Francisco, p.279.
43. Donahue KM, Krouwer HGJ, Rand SD, Pathak AP, Marszalkowski CS, Censky SC, Prost RW (2000) Utility of simultaneously acquired gradient-echo and spin-echo cerebral blood volume and morphology maps in brain tumor patients. *Magn Reson Med* 43:845-853.
44. Quarles CC, Ward BD, Schmainda KM (2005). Improving the reliability of obtaining tumor hemodynamic parameters in the presence of contrast agent extravasation. *Magn Reson Med* 53: 1307-1316.
45. Latchaw RE, Yonas H, Hunter GJ, Yuh WT, Ueda T, Sorensen AG, Sunshine JL, Biller J, Wechsler L, Higashida R, Hademenos G (2003). Guidelines and recommendations for perfusion imaging in cerebral ischemia: A scientific statement for healthcare professionals by the writing group on perfusion imaging, from the Council on Cardiovascular Radiology of the American Heart Association. *Stroke* 34:1084-104.
46. Kidwell CS, Alger JR, Saver JL (2003). Beyond Mismatch Evolving Paradigms in Imaging the Ischemic Penumbra With Multimodal Magnetic Resonance Imaging. *Stroke* 34:2729.
47. Sobesky J, Weber OZ, Lehnhardt F-G, Hesselmann V, Neveling M, Jacobs A, Heiss W-D (2005). Does the Mismatch Match the Penumbra? Magnetic Resonance Imaging and Positron Emission Tomography in Early Ischemic Stroke. *Stroke* 36:980-985.
48. Wu O, Koroshetz WJ, Østergaard L, Buonanno FS, Copen WA, Gonzalez RG, Rordorf G, Rosen BR, Schwamm LH, Weisskoff RM, Sorensen AG (2001). Predicting Tissue Outcome in Acute Human Cerebral Ischemia Using Combined Diffusion- and Perfusion-Weighted MR Imaging. *Stroke* 32:933- 942.
49. Rose SE, Chalk JB, Griffin MP, Janke AL, Chen F, McLachan GJ, Peel D, Zelaya FO, Markus HS, Jones DK, Simmons A, O'Sullivan M, Jarosz JM, Strugnell W, Doddrell DM, Semple J (2001). MRI based diffusion and perfusion predictive model to estimate stroke evolution. *Magn Reson Imaging* 19:1043-53.
50. Gottrup C, Thomsen K, Locht P, Wu O, Sorensen AG, Koroshetz WJ, Østergaard L (2005). Applying instance-based techniques to prediction of final outcome in acute stroke. *Artificial Intelligence in Medicine* 33:223-36.
51. Hjort N, Butcher K, Davis SM, Kidwell CS, Koroshetz WJ, Röther J, Schellinger PD, Warach S, Østergaard L (2005). Magnetic Resonance Imaging Criteria for Thrombolysis in Acute Cerebral Infarct. *Stroke* 36:388-397.
52. Gückel FJ, Brix G, Schmiedek P, Piepgras A, Becker G, Kopke J, Gross H, Georgi M (1996). Cerebrovascular reserve capacity in patients with occlusive cerebrovascular disease: Assessment with dynamic susceptibility contrast-enhanced MR imaging and the acetazolamide stimulation test. *Radiology* 201:405-412.
53. Kluytmans M, van der Grond J, Viergever MA (1998). Gray matter and white matter perfusion imaging in patients with severe carotid artery lesions. *Radiology* 209:675-682.
54. Kirkham FJ, Calamante F, Bynevelt M, Gadian DG, Evans JPM, Cox TC, Connelly A (2001). Perfusion MR abnormalities in patients with sickle cell disease. *Ann Neurol* 49:477-485.
55. Calamante F, Ganesan V, Kirkham FJ, Jan W, Chong WK, Gadian DG, A Connelly (2001). MR perfusion imaging in moyamoya syndrome. Potential implications for clinical evaluation of occlusive cerebrovascular disease. *Stroke* 32:2810-2816.
56. Chalela JA, Kang D-W, MEng ML, Ezzeddine M, Latour LL, Todd JW, Dunn B, Warach S (2004). Early magnetic resonance imaging findings in patients receiving tissue plasminogen activator predict outcome: Insights into the pathophysiology of acute stroke in the thrombolysis era. *Ann Neurol* 55:105–112.
57. Davis SM, Donnan GA, Butcher KS, Parsons M (2005). Selection of thrombolytic therapy beyond 3 h using magnetic resonance imaging. *Curr Opin Neurol* 18: 47-52.
58. Derdeyn CP, Grubb RL Jr, Powers WJ (2000). Cerebral hemodynamic improvement. Methods of measurement and association with stroke risk. *Neurology* 53:251-259.
59. Dynamic Contrast-Enhanced Magnetic Resonance Imaging in Oncology (2005). In series: Medical Radiology – Diagnostic Imaging. (Editors: A. Jackson, D.L. Buckley and G.J.M. Parker). Springer-Verlag, Heidelberg.
60. Cha S (2004). Perfusion MR imaging of brain tumors. *Top Magn Reson Imaging* 15:279-89.
61. Covarrubias DJ, Rosen BR, Lev MH (2004). Dynamic Magnetic Resonance Perfusion Imaging of Brain Tumors. *Oncologist* 9:528-537.